



University of
Pittsburgh

Algorithms and Data Structures 2

CS 1501

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(Slides are adapted from Dr. Ramirez's and Dr. Farnan's CS1501 slides.)

Announcements

- Upcoming deadlines:
 - Lab 11 due on 4/15
 - Homework 12 due on 4/18
 - Assignment 3 and 4 due on 4/18
 - Lab 12 due on 4/22
 - Bonus Lab due on 5/2
 - Assignment 5 due on 5/2
 - Bonus Homework due on 5/2

Previous lecture ...

- Cryptography
 - Caesar Cipher
 - One-Time Pads
 - Symmetric Encryption
 - Asymmetric Encryption
 - RSA

RSA keypair example notes

- p and q must be prime
- $n = p * q$
- $\varphi(n) = (p - 1) * (q - 1)$
- Choose e such that
 - $1 < e < \varphi(n)$ and $\text{GCD}(e, \varphi(n)) = 1$
- Solve $\text{XGCD}(\varphi(n), e) = 1 = \varphi(n) * (-z) + e * d$
- Compute the ciphertext c as:
 - $c = m^e \pmod{n}$
- Recover m as:
 - $m = c^d \pmod{n}$

Implementation concerns

- Encryption/decryption:
 - How can we perform efficient exponentiations?
- Key generation:
 - We can do multiplication, XGCD for large integers
 - What about finding large prime numbers?

Exponentiation

- x^y
- Can easily compute with a simple algorithm:

```
ans = 1
i = y
while i > 0:
    ans = ans * x
    i--
```

- Runtime?

Just like with multiplication, let's consider large integers...

- Runtime = # of iterations * cost to multiply
- So how many iterations?
 - Single loop from 1 to y , so linear, right?
 - What is the size of our input?
 - n
 - The *bitlength* of y ...
 - So, linear in the *value* of y ...
 - But, increasing n by 1 doubles the number of iterations
 - $\Theta(2^n)$
 - Exponential in the *bitlength* of y

Runtime Analysis

y iterations

n -digit

$$y = 2^n - 1$$

$$x^{y-1} \times x : \text{last iteration}$$

n

\nwarrow

?

$$x^2 : 2n$$

$$x^4 : 4n$$

$$x^{y-1} : (y-1) \times n = (2^n - 1 - 1) \times n$$

$$= \theta(2^n \times n)$$

multiplication $(2^n \times n)^{1.58}$

iterations \times multiplication runtime

$$= y \times (2^n \times n)^{1.58}$$

$$= 2^n \times (2^n \times n)^{1.58}$$

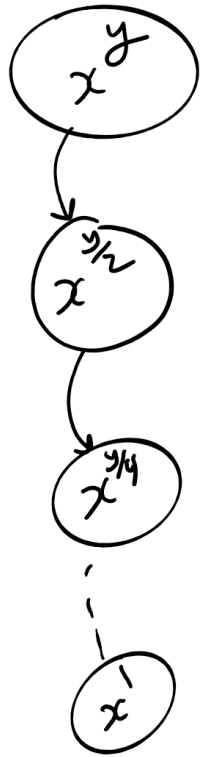
This is RIDICULOUSLY BAD

- Assuming 512 bit operands, 2^{512} :
 - 134078079299425970995740249982058461274793658205923933777
235614437217640300735469768018742981669034276900318581864
86050853753882811946569946433649006084096
- Assuming we can do mults in 1 cycle...
 - Which we *can't* as we learned last lecture
- And further that these operations are completely parallelizable
- 16 4GHz cores = 64,000,000,000 cycles/second
 - $(2^{512} / 64000000000) / (3600 * 24 * 365) =$
 - $6.64 * 10^{135}$ years to compute

This is way too long to do exponentiations!

- So how do we do better?
- Let's try divide and conquer!
- $x^y = (x^{(y/2)})^2$
 - When y is even, $(x^{(y/2)})^2$ * x when y is odd
- Analyzing a recursive approach:
 - Base case?
 - When y is 1, x^y is x ; when y is 0, x^y is 1
 - Runtime?

Runtime Analysis



$$\log_2 y = \log_2 \left(\cancel{2^n} \cdot x \right) = n$$

$$\Theta(\text{work at root}) = \Theta\left(\left(2^{n-1} \cdot n\right)^{1.58}\right)$$

But we need to do expensive mult in each call

- We need to do $\Theta((2^{(n-1)} * n)^2)$ work in just the root call!
 - Our runtime is dominated by multiplication time
 - Exponentiation quickly generates HUGE numbers
 - Time to multiply them quickly becomes impractical

Can we do better?

- We go “top-down” in the recursive approach
 - Start with y
 - Halve y until we reach the base case
 - Square base case result
 - Continue combining until we arrive at the solution
- What about a “bottom-up” approach?
 - Start with our base case
 - Operate on it until we reach a solution

A bottom-up approach

- To calculate x^y

```
ans = 1
foreach bit in y:
    ans = ans2
    if bit == 1:
        ans = ans * x
```

From most to least significant



Bottom-up exponentiation example

- Consider x^y where y is 43 (computing x^{43})
- Iterate through the bits of y (43 in binary: 101011)
- $\text{ans} = 1$

$$\text{ans} = 1^2 = 1$$

$$\text{ans} = 1 * x = x$$

$$\text{ans} = x^2 = x^2$$

$$\text{ans} = (x^2)^2 = x^4$$

$$\text{ans} = x^4 * x = x^5$$

$$\text{ans} = (x^5)^2 = x^{10}$$

$$\text{ans} = (x^{10})^2 = x^{20}$$

$$\text{ans} = x^{20} * x = x^{21}$$

$$\text{ans} = (x^{21})^2 = x^{42}$$

$$\text{ans} = x^{42} * x = x^{43}$$

Bottom-up Exponentiation Example 1

x^y

2^3

$17 : 1000$

16

$ans = 1$

$ans = 1 * 1 = 1$

$ans = 1 * 23 = 23$

$ans = 23 * 23 = (23)^2$

$ans = ans * ans = (23)^4$

$ans = ans * ans = (23)^8$

$ans = ans * ans = (23)^{16}$

$ans = ans * 23 = (23)^{17}$

Bottom-up Exponentiation Example 2

$$x^y = 5^{21}$$

$$21 = 16 + 4 + 1$$

$$\text{ans} = 1$$

$$\begin{aligned} \text{ans} &= \text{ans} * \text{ans} = 1 * 1 \\ &= \text{ans} * x = 1 * 5 \end{aligned}$$

$$\text{ans} = \text{ans} * \text{ans} = 25 = 5^2$$

$$\text{ans} = \text{ans} * \text{ans} = 5^4$$

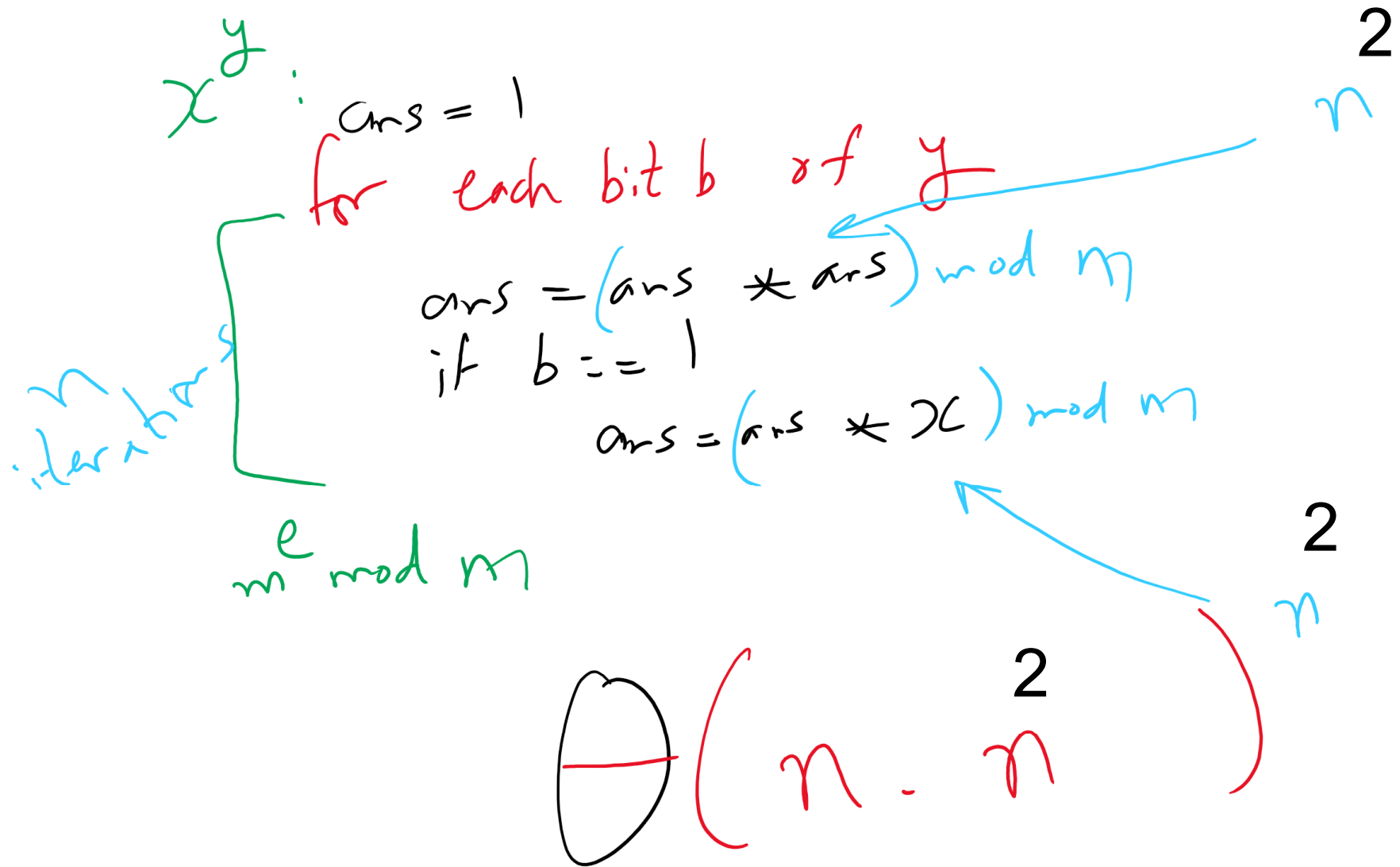
$$\text{ans} = \text{ans} * x = 5^4 * 5 = 5^5$$

$$\text{ans} = \text{ans} * \text{ans} = 5^{10}$$

$$\text{ans} = \text{ans} * \text{ans} = 5^{20}$$

$$\text{ans} = \text{ans} * x = 5^{20} * 5 = 5^{21}$$

Bottom-up Exponentiation



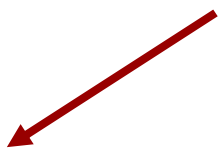
Does this solve our problem with mult times?

- Nope, still squaring ans everytime
 - We'll have to live with huge output sizes
- This does, however, save us recursive call overhead
 - Practical savings in runtime

Efficient exponentiation for RSA

Does this solve our problems?

```
ans = 1
foreach bit in y:
    ans = (ans2 mod n)
    if bit == 1:
        ans = (ans**xx mod n)
```



- How can we improve runtime for RSA exponentiations?
 - Don't actually need x^y
 - Just need $(x^y \bmod n)$

RSA Example 1

- 1) $p = 7$
 $q = 11$
- 2) $n = p \times q = 77$
- 3) $\phi(n) = (p-1)(q-1) = 60$
- 4) $e = 13$
- 5) Use XGCD to compute $d = 37$
 $1 = y \times 60 + d \times 13$

$$\begin{aligned}
 60 &= 4 \times 13 + 8 \iff 8 = 60 - 4 \times 13 \\
 \text{GCD}(13, 8) \\
 13 &= 1 \times 8 + 5 \iff 5 = 13 - 1 \times 8 \\
 \text{GCD}(8, 5) \\
 8 &= 1 \times 5 + 3 \iff 3 = 8 - 1 \times 5 \\
 \text{GCD}(5, 3) \\
 5 &= 1 \times 3 + 2 \iff 2 = 5 - 1 \times 3 \\
 \text{GCD}(3, 2) \\
 3 &= 1 \times 2 + 1 \iff 1 = 3 - 1 \times 2 \\
 \text{GCD}(2, 1) &= 1 \\
 &= 3 - 1 \times (5 - 1 \times 8) \\
 &= 2 \times 8 - 5 \\
 &= 2 \times (8 - 1 \times 5) - 5 \\
 &= 2 \times 8 - 3 \times 5 \\
 &= 2 \times 8 - 3 \times (13 - 1 \times 8) \\
 &= 5 \times 8 - 3 \times 13 \\
 &= 5 \times (60 - 4 \times 13) - 3 \times 13 \\
 1 &= 5 \times 60 - 23 \times 13 \\
 &\quad \quad \quad d \\
 &\quad \quad \quad \begin{array}{r} 300 \\ -299 \\ \hline 1 \end{array} \quad \quad \quad \begin{array}{r} 230 \\ 69 \\ \hline 299 \end{array} \\
 d &= -23 + 60 = 37
 \end{aligned}$$

RSA Example 2

$$p = 5$$
$$q = 13$$

$$n = p * q = 65$$

$$\phi(n) = (p-1) * (q-1) = 4 * 12 = 48$$
$$1 < e < \phi(n) \quad \underline{\text{GCD}}(e, \phi(n)) = 1$$

$$e = 7$$

$$1 = x \cdot \phi(n) + d \cdot e$$
$$= x \cdot 48 + d \cdot 7$$

$$\text{GCD}(48, 7)$$

$$48 = 6 * 7 + 6 \leftarrow b = 48 - 6 * 7$$

$$\text{GCD}(7, 6)$$

$$7 = 1 * 6 + 1 \leftarrow 1 = 7 - 1 * 6$$

$$\text{GCD}(6, 1)$$

$$6 = 6 * 1 + 0$$

$$\text{GCD}(1, 0) = 1$$

$$= 7 - 1 * (48 - 6 * 7)$$

$$1 = \underbrace{7}_{d} * \underbrace{7}_{-1 * 48}$$

$$d = 7$$

$$C = m^e \text{ mod } n$$
$$m \stackrel{?}{=} C^d \text{ mod } n$$

$$\underline{m = 42}$$

RSA Example 3

1) $p = 13$ $q = 7$

$$2) n = P \cdot q = 13 \cdot 7 = 91$$

3) $\phi(n) = \phi(p) \cdot \phi(q) = (p-1)(q-1)$
 \hookrightarrow Count of integers $1 \leq k < n$ s.t. $\text{GCD}(n, k) = 1$

4) select $e = 11$
 $1 < e < \phi(n)$
 $\text{GCD}(e, \phi(n)) = 1$

5) Compute d using XGCD

$$d = \underline{1} \pmod{\phi(n)}$$

$$d = e^{-1} \bmod \phi(n)$$

$$ed = 1 \pmod{\phi(n)}$$

$$ed = \sum \phi(r) + 1$$

$$1 = \text{ed}_+(-z)\phi(n)$$

$$\begin{aligned} 1 &= \text{ed} + (-z)\phi(n) \\ \text{GCD}(e, \phi(n)) &= \text{ed} + (-z)\phi(n) \\ &= \text{GCD}(\phi(n), e) \end{aligned}$$

$$\times \text{GCD}(\phi(n), e)$$

1 ✓

RSA Example 3 (contd.)

$$\text{GCD}(72, 11) = \text{GCD}(11, 72 \div 11)$$

$$72 = 6 \times 11 + 6 \quad \leftarrow 6 = 72 - 6 \times 11$$

$$\text{GCD}(11, 6) = \text{GCD}(6, 11 \div 6)$$

$$11 = 1 \times 6 + 5 \quad \leftarrow 5 = 11 - 1 \times 6$$

$$\text{GCD}(6, 5) = \text{GCD}(5, 6 \div 5)$$

$$6 = 1 \times 5 + 1 \quad \leftarrow$$

$$\text{GCD}(5, 1) = \text{GCD}(1, 5 \div 1)$$

$$= \text{GCD}(1, 0) = 1$$

$$1 = 6 - 1 \times 5$$

$$= 6 - 1 \times (11 - 1 \times 6)$$

$$= 2 \times 6 - 1 \times 11$$

$$= 2 \times (72 - 6 \times 11) - 1 \times 11$$

$$= 2 \times 72 - 13 \times 11$$

$$\begin{array}{r} \times \quad -143 \quad y=d \\ + 144 \end{array}$$

$$\hline 1$$

$$d = -13 = -13 \bmod 72 = 59$$

$$\begin{array}{ll} 6) & m^e \bmod n \\ 7) & d \bmod n \end{array} \quad \begin{array}{ll} 89^{11} \bmod 91 = 45 \\ 45^{59} \bmod 91 = 89 \end{array}$$

RSA Example 4

1) $p = 17$ $q = 31$

2) $n = p \cdot q = 527$

$$\begin{array}{r} 310 \\ 217 \\ \hline 527 \end{array}$$

3) $\phi(n) = \phi(p) \cdot \phi(q) = (p-1)(q-1) = 16 \cdot 30 = 480$

↳ Count of integers s.t. $\text{GCD}(k, n) = 1$
 $1 \leq k < n$

4) Select $e = 7$

• $1 < e < \phi(n)$

• $\text{GCD}(\phi(n), e) = 1$

5) Compute d using $\times \text{GCD}$

$$d = \frac{1}{e} \bmod \phi(n)$$

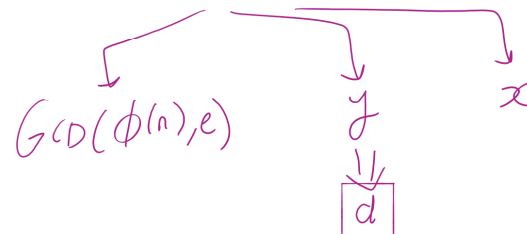
$$ed = 1 \bmod \phi(n)$$

$$= z\phi(n) + 1$$

$$1 = ed + (-z)\phi(n)$$

$$\text{GCD}(\phi(n), e) = e \underbrace{d}_y + \underbrace{(-z)}_x \phi(n)$$

$$\times \text{GCD}(\phi(n), e)$$



RSA Example 4 (contd.)

$$\text{GCD}(480, 7) = \text{GCD}(7, 480 \% 7)$$

$$480 = 68 \times 7 + 4 \Rightarrow 4 = 480 - 68 \times 7$$

$$\text{GCD}(7, 4) = \text{GCD}(4, 7 \% 4)$$

$$7 = 1 \times 4 + 3 \Rightarrow 3 = 7 - 1 \times 4$$

$$\text{GCD}(4, 3) = \text{GCD}(3, 4 \% 3)$$

$$4 = 1 \times 3 + 1$$

$$\text{GCD}(3, 1) = \text{GCD}(1, 3 \% 1)$$

$$= \text{GCD}(1, 0) = 1$$

$$\begin{aligned} 1 &= 4 - 1 \times 3 \\ &= 4 - 1 \times (7 - 1 \times 4) \\ &= 2 \times 4 - 1 \times 7 \\ &= 2 \times (480 - 68 \times 7) - 1 \times 7 \end{aligned}$$

$$1 = \underbrace{2 \times 480}_{x} - \underbrace{137}_{d} \times 7$$

$$d = -137 \% \phi(n) = \frac{480 - 137}{d = 343}$$

$$m^e \bmod n = m^7 \bmod 527$$

$$106^7 \bmod 527 = 115$$

$$C^d \bmod n = 15^{343} \bmod 527 = 106$$

OK, but how does $m^{ed} = m \bmod n$?

- Feel free to look up the proof using Fermat's little theorem
 - Knowing this proof is **NOT** required for the course
 - Knowing how to generate RSA keys and encrypt/decrypt **IS**
- For this course, we'll settle with our example showing that it *does* work

Why is RSA secure?

- 4 avenues of attack on the math of RSA were identified in the original paper:
 - Factoring n to find p and q
 - Determining $\varphi(n)$ without factoring n
 - Determining d without factoring n or learning $\varphi(n)$
 - Learning to take e^{th} roots modulo n

Factoring n

- To the best of our knowledge, this is *hard*
 - A 768 bit RSA key was factored one time using the best currently known algorithm
 - Took 1500 CPU years
 - 2 years of real time on hundreds of computers
 - Hence, large keys are pretty safe
 - 2048 bit keys are a pretty good bet for now

What about determining $\phi(n)$ without factoring n ?

- Would allow us to easily compute d because $ed = 1 \bmod \phi(n)$
- Note:
 - $\phi(n) = n - p - q + 1$
 - $\phi(n) = n - (p + q) + 1$
 - $(p + q) = n + 1 - \phi(n)$
 - $(p + q) - (p - q) = 2q$
 - Now we just need $(p - q)$...
 - $(p - q)^2 = p^2 - 2pq + q^2$
 - $(p - q)^2 = p^2 + 2pq + q^2 - 4pq$
 - $(p - q)^2 = (p + q)^2 - 4pq$
 - $(p - q)^2 = (p + q)^2 - 4n$
 - $(p - q) = \sqrt{(p + q)^2 - 4n}$
- If we can figure out $\phi(n)$ efficiently, we could factor n efficiently!

$$\begin{aligned}\phi(n) &= (p-1)(q-1) \\ &= pq - q - p + 1 \\ &= n - q - p + 1\end{aligned}$$

Reduction and RSA Security

Problem A reduces to Problem B

iff
a solution for A leads
to a solution for B

RSA Attack \Rightarrow Integer Factorization

input: large integer n
output: prime factors

\rightarrow Believed to be hard

$d \Rightarrow$ factor n efficiently

Determining d without factoring n or learning $\varphi(n)$?

- If we know, d , we can get a multiple of $\varphi(n)$
 - $ed = 1 \bmod \varphi(n)$
 - $ed = k\varphi(n) + 1$
 - For some k
 - $ed - 1 = k\varphi(n)$
- It has been shown that n can be efficiently factored using any multiple of $\varphi(n)$
 - Hence, this would provide another efficient solution to factoring!

Learning to take e^{th} roots modulo n

- Conjecture was made in 1978 that breaking RSA would yield an efficient factoring algorithm
 - To date, it has been not been proven or disproven

This all leads to the following conclusion

- Odds are that breaking RSA efficiently implies that factoring can be done efficiently.
- Since factoring is probably hard, RSA is probably safe to use.

RSA Implementation concerns

- Encryption/decryption:
 - How can we perform efficient exponentiations?
- Key generation:
 - We can do multiplication, XGCD for large integers
 - What about finding large prime numbers?

Prime testing option 1: BRUTE FORCE

- Try all possible factors of x
 - $1 \dots \sqrt{x}$
 - aka $1 \dots \sqrt{2^{\text{size}(x)}}$
 - For a total of $2^{(\text{size}(x)/2)}$ factor checks
- A factor check should take about the same amount of time as multiplication
 - $\text{size}(x)^2$
- So our runtime is $\Theta(2^{(\text{size}(x)/2)} * \text{size}(x)^2)$

$$\sqrt{x} = \sqrt{2^n} = 2^{n/2}$$

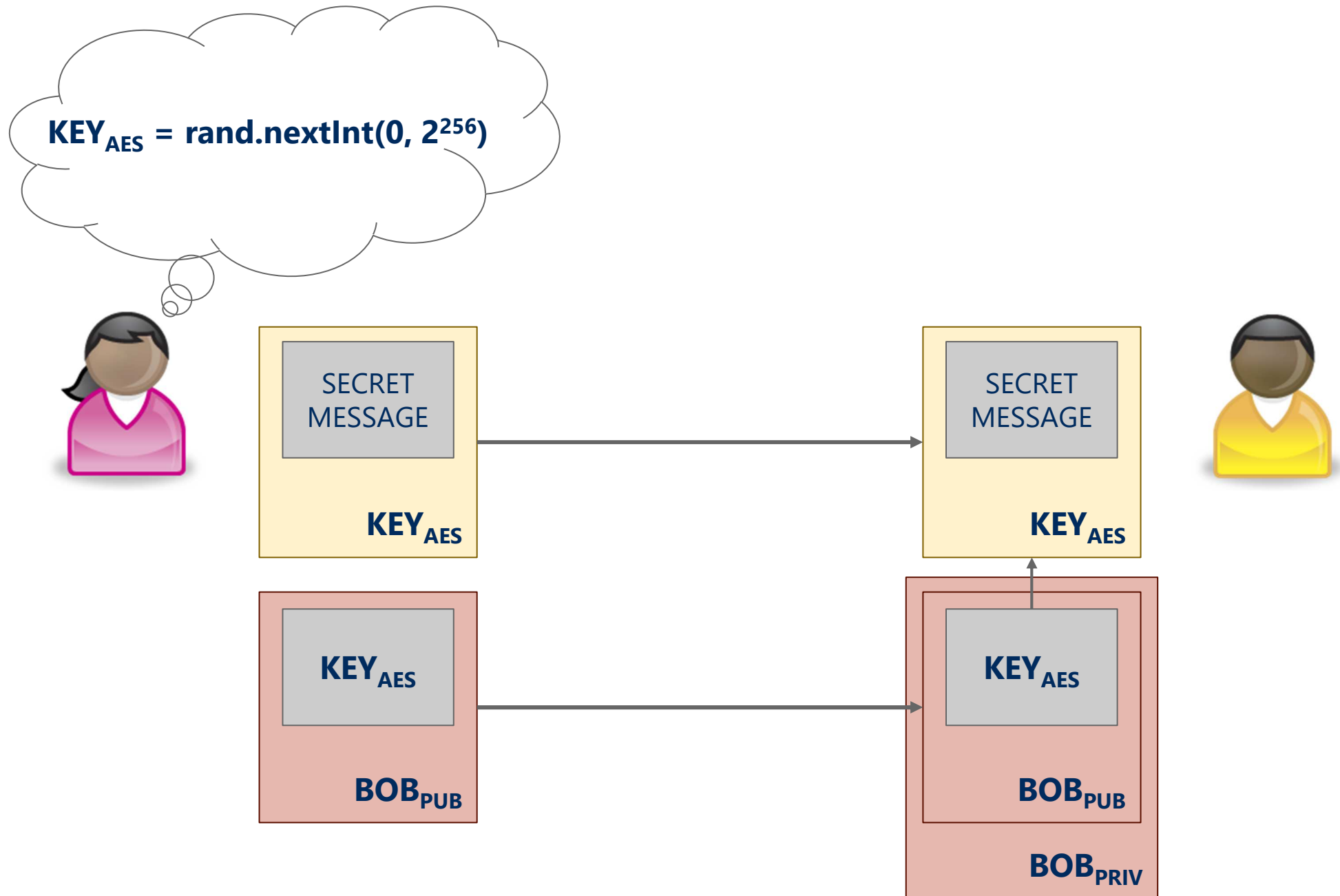
Option 2: A probabilistic approach

- Need a method $\text{test} : Z \times Z \rightarrow \{T, F\}$
 - If $\text{test}(x, a) = F$, x is composite based on the witness a
 - If $\text{test}(x, a) = T$, x is probably prime based on the witness a
 - To test a number x for primality:
 - Randomly choose a witness a
 - if $\text{test}(x, a) = F$, x is composite
 - if $\text{test}(x, a) = T$, loop
 - Possible implementations of $\text{test}(x, a)$:
 - Miller-Rabin, Fermat's, Solovay–Strassen
- often probability $\approx 1/2$
- k repetitions leads to probability that x is composite $\approx 1/2^k$

RSA still slower (generally) than symmetric encryption

- If only we could have the speed of symmetric encryption without the key distribution woes!
 - What if we transmitted symmetric crypto keys with RSA?
 - RSA Envelopes!
- Going back to Alice and Bob
 - Alice generates a random AES key
 - Alice encrypts her message using AES with this key
 - Alice encrypts the key using Bob's RSA public key
 - Alice sends the encrypted message and encrypted key to Bob
 - Bob decrypts the AES key using his RSA private key
 - Bob decrypts the message using the AES key

RSA Envelope example



Another fun use of RSA...

- Notice that encrypting and decrypting are inverses
 - $m^{\text{ed}} = m^{\text{de}} \pmod n$
- We can “decrypt” the message first with a private key
- Then recover the message by “encrypting” with a public key
- Note that anyone can recover the message
 - However, they know the message must have come from the owner of the private key
 - Using RSA this way creates a *digital signature*

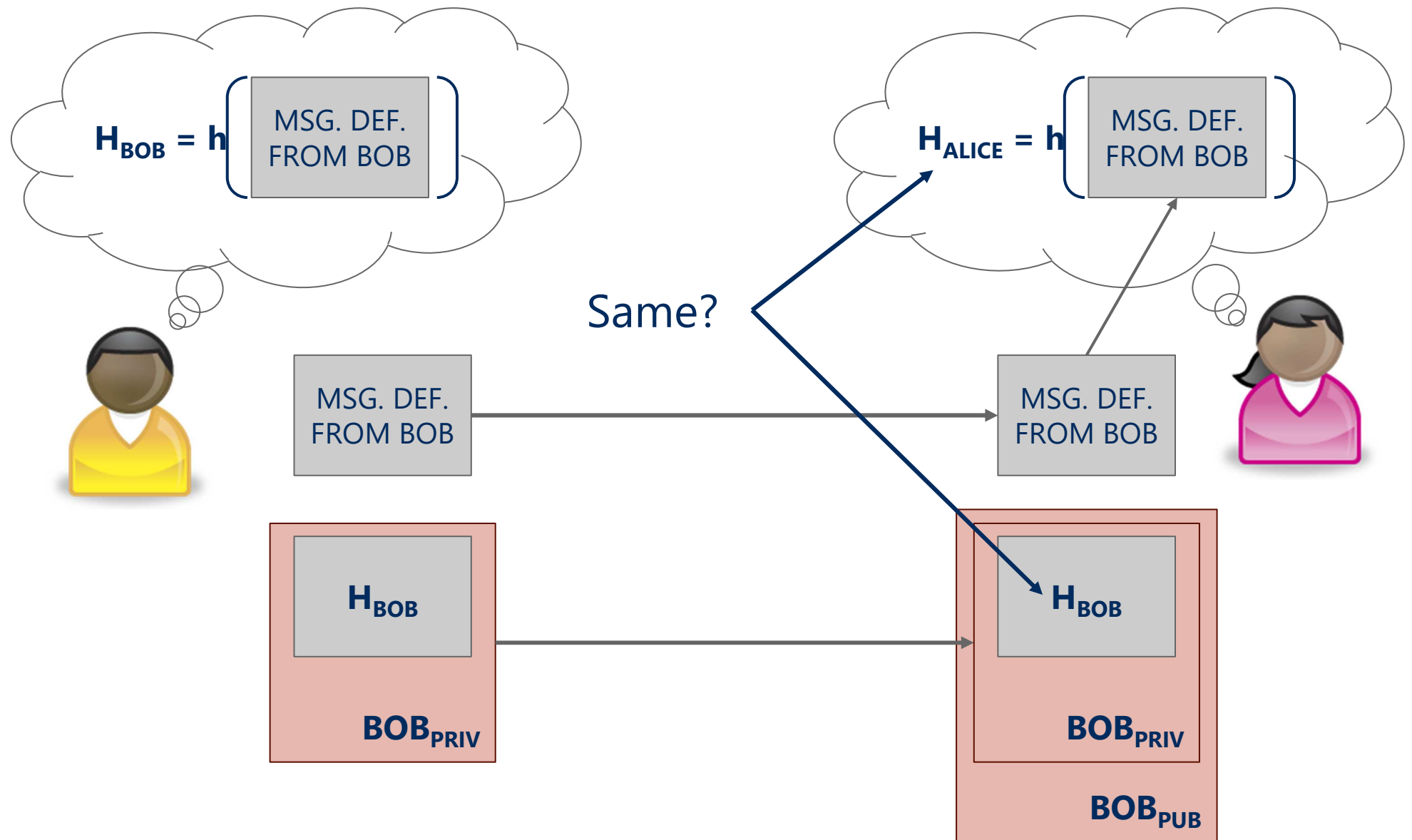
Do RSA signatures need to be slow?

- We encrypted symmetric crypto keys before to speed things up...
 - We'll need another crypto primitive to help out here
 - Cryptographically secure hash functions

Hashing for security (similarities)

- Cryptographically secure hash functions share properties with the hash functions we've already talked about in recitations:
 - Map from some input domain to a limited output range
 - Though output ranges are much larger here
 - For modern algorithms 224-512 bit output sizes
 - Time required to compute the hash is proportional to the size of the item being hashed
 - Though, practically, cryptographic hash functions are more expensive

Now just sign a hash of the message!



Why does it work?

$$\begin{aligned} \left(H_{\text{Bob}}^d \text{ mod } n \right)^e &= H_{\text{Bob}}^{de} \text{ mod } n \\ &= H_{\text{Bob}}^{ed} \text{ mod } n \\ &= H_{\text{Bob}} \text{ mod } n \end{aligned}$$

What about collisions?

- If Bob signs a hash of the message "I'll see you at 7"
- It could appear that Bob signed any message whose hash collides with "I'll see you at 7"...
- If $h(\text{"I'll see you at 7"}) == h(\text{"I'll see you after I rob the bank"})$, Bob could be in a lot of trouble
- An attack like this helped the Flame malware to spread
- This is also the reason Google is aiming to deprecate SHA-1

Hashing for security (differences)

- This is why cryptographically secure hash functions must support additional properties:
 - It should be infeasible to find two different messages with the same hash value
 - It should be infeasible to recover a message from its hash
 - Should require a brute force approach
 - Small changes to a message should change the hash value so extensively that the new hash value appears uncorrelated with the old hash value

Public key isn't perfect

What do you do when a private key is compromised?

NEVER IMPLEMENT YOUR OWN CRYPTO

Use a trusted and tested library.

Master Method

- How can we analyze the runtime of a recursive algorithm?
 - Master Method!

So what's the runtime???

- Recursion really complicates our analysis...
- We'll use a *recurrence relation* to analyze the recursive runtime
 - Goal is to determine:
 - How much work is done in the current recursive call?
 - How much work is passed on to future recursive calls?
 - All in terms of input size

Recurrence relation for divide and conquer multiplication

- Assuming we cut integers exactly in half at each call
 - I.e., input bit lengths are a power of 2
- Work in the current call:
 - Shifts and additions are $\Theta(n)$
- Work left to future calls:
 - 4 more multiplications on half of the input size
- $T(n) = 4T(n/2) + \Theta(n)$

Soooo... what's the runtime?

- Need to solve the recurrence relation
 - Remove the recursive component and express it purely in terms of n
 - A “cookbook” approach to solving recurrence relations:
 - The master theorem

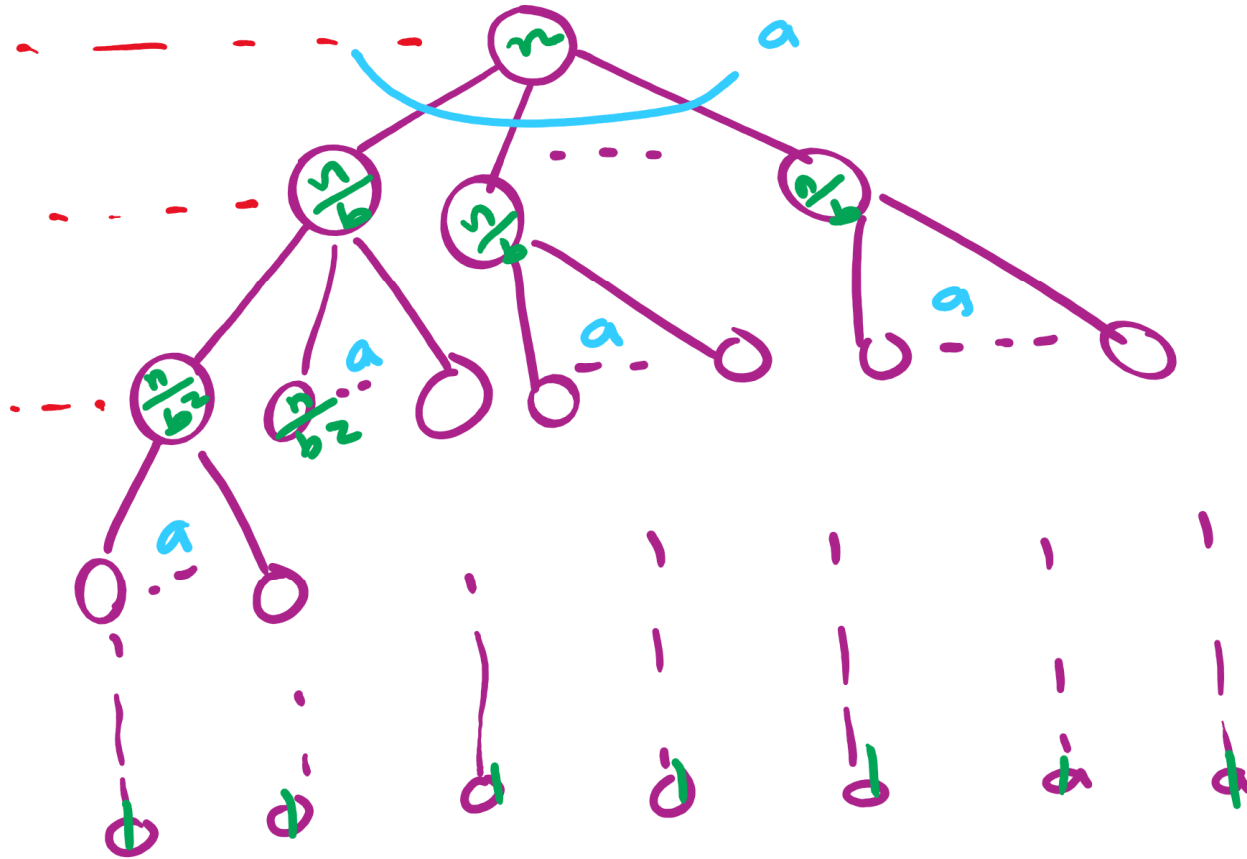
The master theorem

- Usable on recurrence relations of the following form:

$$T(n) = aT(n/b) + f(n)$$

- Where:
 - a is a constant ≥ 1
 - b is a constant > 1
 - and $f(n)$ is an asymptotically positive function

Recursion Tree


$$\# \text{ nodes} \times \text{work / node}$$

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8/29/2022